

Detours in Scope-Based Route Planning^{*}

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Abstract. We study a dynamic scenario of the static route planning problem in road networks. Particularly, we put accent on the most practical dynamic case – increased edge weights (up to infinity). We show how to enhance the scope-based route planning approach presented at ESA’11, [16] to intuitively by-pass closures by detours. Three variants of a detour “admissibility” are presented – from a simple one with straightforward implementation through its enhanced version to a full and very complex variant which always returns an optimal detour.

1 Introduction

Route planning has many important everyday applications. In fact, it is a single pair shortest path (SPSP) problem in real-world road networks. There are several specific variations of this problem. Particularly, there are two route planning *variants* and two *scenarios*. First, in a time-independent variant which is studied in our paper, chosen cost function does not depend on time while in a more challenging time-dependent variant it does – i.e., costs of a route depends on departure time. Secondly, a route planning scenario is static if a road network is fixed while in a dynamic scenario costs or even an overall is changing predictably (traffic jams, turn-angle limits) or unexpectedly (car accidents).

Complexity of the problem depends varies in different combinations of a variant and a scenario. The very basic static time-independent route planning received a lot of attention during the last decades and hence we focus on dynamic time-independent route planning which is more complicated but also more realistic. Furthermore, we believe it has one of the best practical motivations among all route planning variations. Unfortunately, neither classical graph algorithms for SPSP problem such as Dijkstra’s [1], A* [3] algorithm nor their dynamic adaption [2] are well suitable even for time-independent route planning. It is mainly because graphs representing real-world road network are very huge. Clearly, a feasible solution lies in splitting algorithms in two phases since route planning problem instances are mostly solved on a single road network. First, in a *preprocessing* phase, we invest some time to exploit auxiliary data from a road network. Secondly, these auxiliary data are utilized to improve both time and space complexity of subsequent instances of the problem – *queries*.

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Related Work. This technique led to several very interesting static approaches in the last decade, we refer our reader to surveys [13,14]. Unfortunately, most of the recently developed techniques require a rather unrealistic assumption – static road networks. Modifying static approaches for dynamic road networks is much harder than one might expect because dynamic changes invalidate preprocessed data. Nevertheless, there are modifications already proven to work in a dynamic scenario such as, for instance, highway-hierarchies [10,12], ALT [9,11] or geometric containers [6,8]. Even though this paper does not deal with time-dependent route planning, we refer to [14] for more details on this complicated topic.

Recently, in order to fill a gap between a variety of exact route planning approaches, we have published [16] a different novel approach aimed at “reasonable” routes. It is based on a concept of scope, whose core idea can be informally outlined as follows: The edges of a road network are associated with a *scope* map such that an edge e assigned scope s_e is admissible on a route R if, before or after reaching e , such R travels distance less than a value associated with s_e on edges with scope higher than s_e . The desired effect is that low-level roads are fine near the start or target positions, while only roads of the highest scope are admissible in the long middle sections of distant routing queries. Overall, this nicely corresponds with human thinking of intuitive routes, and allows for a very space-efficient preprocessing, too.

New Contribution. We present a dynamic adjustment of aforementioned admissibility concept along with a simple modification of scope-based Dijkstra’s algorithm. We allow a reasonably small number of road closures in a road network and our approach can be straightforwardly generalized also for slowed-down roads. We present three definitions of admissible detours – from the simple one with efficient implementation with time and space complexity of the original scope-based Dijkstra’s algorithm, though its enhanced version to the full and most complex one which always ensures the existence of a detour. We have briefly experimentally evaluated implementation of the first and second definitions with very promising results and have also incorporated these algorithms into scope-based route planning approach.

2 Fundamentals

Graphs and Walks. A *directed graph* G is a pair of a finite set $V(G)$ of vertices and a finite multi-set $E(G) \subseteq V(G) \times V(G)$ of edges. A *walk* $P \subseteq G$ is an alternating sequence $(u_0, e_1, u_1, \dots, e_k, u_k)$ of vertices and edges of G such that $e_i = (u_{i-1}, u_i)$ for $i = 1, \dots, k$. To point out the start vertex $u = u_0$ and the end $v = u_k$, we say P is a u - v walk. A *subwalk* $Q \subseteq P$ is $Q = (x = u_i, e_{i+1}, \dots, u_j = y)$ for some $0 \leq i \leq j \leq k$, and it is referred to as $Q = P^{xy}$ (for simplicity, possible ambiguity with exact reference to the position of x, y in P is neglected). The *weight* of a walk $P \subseteq G$ w.r.t. a weighting $w : E(G) \mapsto \mathbb{R}$ of G is defined as $|P|_w = w(e_1) + w(e_2) + \dots + w(e_k)$ where $P = (u_0, e_1, \dots, e_k, u_k)$. An *optimal walk* between two vertices achieves the minimum weight over all walks.

Road Networks. A *road network* is referred to as a pair (G, w) . Naturally, G is a directed graph G such that the junctions are represented by $V(G)$ and the roads by $E(G)$. Moreover, G is assigned a *non-negative* edge weighting w representing chosen cost function (or a suitable combination of cost functions).

Problem Formulation. Given a road network (G, w) and start and target vertices $s, t \in V(G)$, find a walk from s to t *optimal with respect to given optimality criteria*. Regarding a weighting function, there are two *variants* of the problem – in a *time-independent* one, $w : E(G) \mapsto \mathbb{R}_0^+$, while in *time-dependent*, $w : E(G) \times \mathbb{N}_0 \mapsto \mathbb{R}_0^+$ depends on discrete departure time slots (or their linear interpolation, see [14]). Moreover, there are two route planning *scenarios* – in a *static* one, both G and w are fixed during all queries. On the other hand, G and w may change either predictably (e.g. rush hours) or unexpectedly (e.g. car accidents) in a *dynamic* scenario; the updated road network is denoted by (G^*, w^*) .

In this paper, we study a specific version of the time-independent *dynamic* route planning problem: the underlying graph G remains static and w is only allowed to increase. Formally, $G^* = G$ and $w^* : E(G) \mapsto \mathbb{R}_0^+ \cup \{\infty\}$, $w^*(e) \geq w(e)$ for all $e \in E(G)$ (particularly, $w^*(e) = \infty$ implies that e is “closed”). The choice of this version is driven by typical real-world situations. To advocate this simply and informally, occasions on which a road is improved or a new one built are much less frequent than temporary road closures. We thus for simplicity omit the possibility of adding new edges to G in this paper, though we keep in mind that locally adding an edge may be necessary, e.g., to designate a detour.

We note again that we do not deal with the full power of time dependent planning as [14], mainly due to a totally different conceptual view of the latter and also due to the fact that it is not well understood yet. Still, our dynamic scenario can incorporate some aspects of time-dependent weighting function, namely on-demand reflection of rush hours on selected edges (i.e., busy roads).

Finally, we assume familiarity with classical Dijkstra’s algorithm and its bidirectional variants (otherwise see Appendix A) for shortest paths.

2.1 Scope-Based Route Planning in a Nutshell

A simplified version of the recently introduced *scope concept* [16] is very briefly recapitulated here. We strongly recommend reading the original paper [16] for better understanding and more detailed treatment. Due to lack of space, many details are omitted here. The purpose of introducing scope has been twofold: to capture in a mathematically rigorous way a vague meaning of “comfort and intuitiveness” of a route, and at the same time allow for more memory efficient preprocessing of the static road network data for very fast subsequent queries. It works best with a cost function correlated with travel time.

Definition 2.1 (Scope [16]). Let (G, w) be a road network. A scope mapping is defined as $\mathcal{S} : E(G) \mapsto \mathbb{N}_0 \cup \{\infty\}$ such that $0, \infty \in \text{Im}(\mathcal{S})$. Elements of the image $\text{Im}(\mathcal{S})$ are called *scope levels*. Each scope level $i \in \text{Im}(\mathcal{S})$ is assigned a constant value of scope $\nu_i^{\mathcal{S}} \in \mathbb{R}_0 \cup \{\infty\}$ such that $0 = \nu_0^{\mathcal{S}} < \nu_1^{\mathcal{S}} < \dots < \nu_\infty^{\mathcal{S}} = \infty$.

In practice there are only a few scope levels in $Im(\mathcal{S})$ (say, 5). The desired effect, as formalized next, is in *clever* using low-level roads only near the start or target positions until higher level roads become widely available. For that one has to count how much has been travelled along a given walk on edges of higher level (Def. 2.2), and do not admit lower-level edges further on (Def. 2.3, iii.).

Definition 2.2 (Scope \mathcal{S} -draw). Let (G, w) be a road network and a scope mapping \mathcal{S} . The \mathcal{S} -draw value of a walk $P \subseteq G$ is a vector $draw^{\mathcal{S}}(P) = \sigma$ indexed by $Im(\mathcal{S})$ such that $\sigma_\ell = \sum_{f \in E(P), \mathcal{S}(f) > \ell} w(f)$ for $\ell \in Im(\mathcal{S})$.

For practical applications, the formula for $draw^{\mathcal{S}}(P)$ is expanded with a so called *turn-scope handicap* [16] penalizing for missed higher-level edges.

Definition 2.3 (Admissibility [16]). Let (G, w) be a road network. Consider a walk $P = (s = u_0, e_1, \dots, e_k, u_k = t) \subseteq G$ from the start s to the end t .

- a) An edge $e = (v_1, v_2) \in E(G)$ is x -admissible in G for a scope mapping \mathcal{S} if, and only if, there exists a walk $Q \subseteq G - e$ from $x \in V(G)$ to v_1 such that
 - i. each edge of Q is recursively x -admissible in $G - e$ for \mathcal{S} ,
 - ii. Q is optimal subject to (1), and
 - iii. for $\ell = \mathcal{S}(e)$ and $\sigma = draw^{\mathcal{S}}(Q)$, it is $\sigma_\ell \leq \nu_\ell^{\mathcal{S}}$.
- b) Whole P is s -admissible in G if every $e_i \in E(P)$ is s -admissible in G ;
- c) and P is \mathcal{S} -admissible (with implicit respect to s, t) if there exists $0 \leq j \leq k$ such that every $e_m \in E(P)$, $m \leq j$, is s -admissible in G , and the reverse of every $e_m \in E(P)$, $m > j$, is t -admissible in reverse G^R .

Note the last part c) of Definition 2.3— there and further on we often use a simplifying term “in reverse” to refer to the network (G^R, w) obtained by reversing all edges of G , and to exchanged start and end t, s . This is to make our definitions symmetric from the viewpoint of s as from t .

Remark 2.4. A vertex $v \in V(G)$ is s -saturated (for $s \in V(G)$) if $[draw^{\mathcal{S}}(P)]_\ell > \nu_\ell^{\mathcal{S}}$ for $\ell < \infty$ where P is an optimal s -admissible $s - v$ walk. In other words, a vertex is s -saturated if any s -admissible edge leaving the last vertex of P has the scope level ∞ .

Static \mathcal{S} -Dijkstra’s Algorithm of [16] (see Appendix B). Having a definition of admissible walks, one needs also a corresponding route planning algorithm. The seemingly complicated Def. 2.3 can actually be smoothly and simply integrated into traditional Dijkstra’s or A* algorithms and their bidirectional variants.

- For each scanned vertex v , a track of the best value $\sigma[v]$ of \mathcal{S} -draw is kept.
- An edge e leaving v is relaxed only if $\sigma_{\mathcal{S}(e)}[v] \leq \nu_{\mathcal{S}(e)}^{\mathcal{S}}$ (cf. Def. 2.3, iii.).

Theorem 2.5 ([16]). \mathcal{S} -Dijkstra’s algorithm (*uni-directional*), for a road network (G, w) , a scope mapping \mathcal{S} , and a start vertex $s \in V(G)$, computes an optimal s -admissible walk from s to every $v \in V(G)$ in time $\mathcal{O}(|E(G)| \cdot |Im(\mathcal{S})| + |V(G)| \cdot \log |V(G)|)$.

An optimal \mathcal{S} -admissible s - t walk in (G, w) is then found by a natural bidirectional application of Theorem 2.5, which also allows for a very efficient pre-processing of the road network, as detailed in [16].

3 Detours – on the Price of Admissibility

In the dynamic scenario a static \mathcal{S} -Dijkstra’s algorithm may badly fail. Imagine a driver approaching a restricted tunnel (e.g. by a car accident) such that it can be bypassed on low-level mountain roads only. What would a driver do?

She could drive through this restrictions according to her original route plan and accept increased cost (if possible). However, there might be a better route. Notice that a re-planning her route from scratch might not be possible due to temporarily invalidated preprocessed data. The best intuitive solution for her is to slip off the original route (even ahead of the restricted tunnel) and use a detour by re-allowing the use of low-level (i.e., inadmissible in the ordinary setting) mountain road nearby this restriction. She still wants to minimize costs of such detour and drive comfortably within the margins of such adjusted scope admissibility view. On the other hand, static Def. 2.3 would not allow the aforementioned detour for natural reasons (unless the closure is near the start or target position); the static scope mapping simply cannot account for such unexpected closures in advance. Yet there is a good solution which extends the very nice properties of static scope to the considered dynamic scenario.

3.1 General Strategy for Avoiding Closures

As mentioned in Section 2, a formal view of this dynamic scenario is that the original static road network (G, w) with \mathcal{S} is replaced by (G, w^*) where w^* increases the weight of some edges (up to ∞), while \mathcal{S} and G stay the same. Let $C = \{e \in E(G) : w^*(e) > w(e)\}$. For simplicity, we further assume $w^*(e) = \infty$ for $e \in C$ and call C the set of (road) closures, but a generalization to arbitrary weight increase $w^*(e) > w(e)$ is straightforward. Hence, from now on, we focus only on w^* and the closure set $C \subseteq E(G)$ which is *assumed relatively small*.

The mathematical task is to relax the meaning of scope admissibility close to the edges of C . For that we slightly extend the definitions of Section 2.1: We say ω is an \mathcal{S} -vector if ω is indexed by $Im(\mathcal{S})$. As in Definition 2.3 b), a walk $P = (s = u_0, e_1, \dots, u_k = t)$ is called (s, ω) -admissible if the condition (iii) newly reads $\sigma_\ell + \omega_\ell \leq \nu_\ell^S$. Similarly, as in Def. 2.3 b), this P is \mathcal{S} -admissible when amended with the initial and/or final \mathcal{S} -vectors ω^s, ω^t , if there exists $0 \leq j \leq k$ such that every $e_i \in E(P)$, $i \leq j$, is (s, ω^s) -admissible in G , and the reverse of every $e_i \in E(P)$, $i > j$, is (t, ω^t) -admissible in reverse G^R . This definition simply captures a possibility that some of the \mathcal{S} -draw value has already been used (exhausted) before entering P .

As mentioned at the beginning of this section, we would like to allow limited use of inadmissible (either for s or t) edges near the closures. The crucial question is to decide which inadmissible edges should be additionally allowed. The first step is to specify at which vertices a closure affects an s - t route.

Definition 3.1 (C-obstructed vertex). Let (G, w) be a road network with a scope mapping \mathcal{S} , $C \subseteq E(G)$ a set of closures and $s, t \in V(G)$.

- i. A vertex $d \in V(G)$ is C -obstructed for the initial \mathcal{S} -vector ω^s and target t if there exists a d - t walk $Q \subseteq G$ which is optimal \mathcal{S} -admissible when amended with initial ω^s , such that Q contains some (any) edge $(z, v) \in C$.
- ii. A C -obstruction state of d is the \mathcal{S} -vector σ such that, for each scope level $\ell \in \text{Im}(\mathcal{S})$, σ_ℓ is the minimum of $[\text{draw}^{\mathcal{S}}(Q^{dz})]_\ell$ over all walks Q and z as from (i.), where Q^{dz} is the (shortest) d - z subwalk of Q .
- iii. Moreover, a C -obstruction level of d (again for initial ω^s and target t) is the minimum scope level $\ell \in \text{Im}(\mathcal{S})$ such that $\sigma_\ell \leq \nu_\ell^{\mathcal{S}}$.

If $\omega^s = (\infty, \dots, \infty)$ (the most restrictive case), then we shortly say that d is C -obstructed for the target t . Analogously, d is C -obstructed for the start s and final \mathcal{S} -vector ω^t if (i.–iii.) holds in reverse.

Note that typically only one optimal d - t walk Q exists in (i.), but for formal correctness of the definition we have to range over all possible ones in (ii.).

For an informal explanation, d is C -obstructed when an edge $e \in C$ (a closure) affects an optimal \mathcal{S} -admissible walk from d to the target t , and e is not “far away” from d wrt. the \mathcal{S} -draw value on level ℓ ; or this symmetrically happens in reverse G^R . The role of ω^s, ω^t in Def. 3.1 is purely technical (to capture \mathcal{S} -draw value travelled prior to approaching d in certain situations), and one may simply ignore it for getting the general informal picture.

3.2 Simple Detours

In this section, we can finally define the simplest version of C -detour admissibility – i.e., the relaxation of traditional \mathcal{S} -admissibility in the presence of closures. Informally, an s - t walk is simple C -detour \mathcal{S} -admissible if it avoids all the closed roads in C ; and, in addition to ordinary \mathcal{S} -admissibility (Def. 2.3), certain “detour permits” are issued near those edges of C which (potentially) obstruct an optimal s - t walk. A simple detour permit just allows limited local use of edges of low scope-level (which would not be permitted otherwise by Def. 2.3), until non-closed higher level edges become available again. These permits (and subsequent detours) can be repeated along an admissible walk, as needed by further closures. The formal definition is as follows.

Definition 3.2 (Simple C -detour \mathcal{S} -admissibility). Let (G, w) be a road network, \mathcal{S} a scope mapping on it, and $C \subseteq E(G)$ a set of road closures. An s - t walk $P = (s = u_0, e_1, \dots, e_k, u_k = t) \subseteq G$ is simple C -detour \mathcal{S} -admissible if $E(P) \cap C = \emptyset$ and there exists $0 \leq j \leq k$ such that, for each $e_m \in E(P)$, (at least) one of the following holds:

- i. $m \leq j$ and e_m is s -admissible in G for \mathcal{S} .
- ii. $m > j$ and e_m is t -admissible in reverse G^R for \mathcal{S} .
- iii. $\mathcal{S}(e_m) = \ell < \infty$ and there exists $0 \leq i < m$ such that;

- the vertex $d = u_i$ of P is C -obstructed for the target t – optionally also for initial draw $^S(Q)$ where Q is an optimal s -admissible s - d walk¹, and
 - the level of obstruction of d is $\ell < \infty$ and no vertex among u_{i+1}, \dots, u_{m-1} is left by an edge $f \notin C$ in G of $S(f) > \ell$.
- iv. Or, stating briefly, (iii) holds in reverse for some $m \leq i < t$.

In this definition, points (i.), (ii.) refer to ordinary \mathcal{S} -admissibility. Point (iii.) then permits use of lower-level edges since an obstructed vertex d till higher-level becomes available. Actually, there is a minor issue of aforementioned Def. 3.2 left for discussion (and resolution) to Section 3.3.

Simple C -Detour \mathcal{S} -Dijkstra's Algorithm. Even though Def. 3.2 might seem complicated, it can be implemented straightforwardly by running just a single bidirectional \mathcal{S} -Dijkstra's algorithm. Due to lack of space we present the idea of our algorithm and omit implementation details in this paper. Let (G, w) be an original road network with a scope mapping \mathcal{S} , $s, t \in V(G)$ start and target vertices, w^* a changed weighing and C a set of closures.

1. Static initialization

Static \mathcal{S} -Dijkstra's algorithm is executed in (G, w) bidirectionally to find optimal \mathcal{S} -admissible $s - t$ walk P . If $w(P) = w^*(P)$ then our algorithm terminates since no detour is needed. Otherwise an optimal simple C -detour \mathcal{S} -admissible $s - t$ walk Q is to be found. If $w^*(Q) < w^*(P)$ then Q is returned, otherwise P .

2. Identifying C -obstructed vertices

In order to find Q , we must identify C -obstructed for both s and t and (possibly) their corresponding ω_t, ω_s (for obstructions close the the start or target). This is done again by running static \mathcal{S} -Dijkstra's algorithm executed bidirectionally from s and t , but now in updated (G, w^*) and $(G, w^*)^R$, respectively. Moreover, the algorithm does not terminate until both search queues are empty. Consider the forward search, the reverse is analogous.

When \mathcal{S} -Dijkstra's algorithm scans a vertex u such that an edge $(\pi[u], u)$ from its predecessor $\pi[u]$ is a closure, u is C -obstructed Def. 3.1. All successors of u are C -obstructed as well. For such vertices v a reference to the end vertex of the nearest closure on their s -admissible $s - v$ walk is stored. Using this reference we can easily determine an obstruction state in constant time. Using this process we identify all C -obstructed vertices for s with final $\omega_t = (\infty, \dots, \infty)$. To get the other C -obstructed vertices for s we must combine forward and reverse searches as follows. When there is a vertex w scanned in both direction such that there is a closure $c = (x, y)$ on $w - t$ t -admissible walk then all non- t -saturated vertices on $y - t$ t -admissible walk are C -obstructed s with final final ω_t given by their \mathcal{S} -draw values in the reverse search.

¹ This part with Q actually applies only when d is not s -saturated, i.e., nearby s .

3. Permitting not \mathcal{S} -admissible edges

Now we have identified C -obstructed vertices for both s and t together with their C -obstruction states and for those close enough to s or t we also know initial and final vectors ω^t and ω^s . From obstruction states we can easily determine obstruction levels of these vertices, \mathcal{S} -draw values, predecessors and distance estimates from s (or to t , respectively). Again, consider the forward direction. If a C -obstructed vertex v for t has obstruction level ℓ smaller than ∞ , gets a *permit* for relaxing any of its outgoing edges $e = (v, w)$ of level $\mathcal{S}(e) = \ell$ without updating \mathcal{S} -draw value of w and v is pushed to the search queue with updated distance estimate and parent. The same holds for all edges of w and next successors. Once there is an edge of scope higher than ℓ outgoing w , permitting stops. This is done for all C -obstructed vertices for both s and t .

4. Completing simple C -detour \mathcal{S} -admissible $s - t$ walk

Finally, we keep static \mathcal{S} -Dijkstra's algorithm running with all auxiliary data structures computed so far in (G, w^*) , the resulting $s - t$ walk is Q .

We would like to emphasize that all aforementioned steps can be done in a single bidirectional execution of \mathcal{S} -Dijkstra's algorithm. Hence running time of aforementioned algorithm remains in $\mathcal{O}(|E(G)| \cdot |Im(\mathcal{S})| + |V(G)| \cdot \log |V(G)|)$.

3.3 Enhanced Detours

Unfortunately, aforementioned Definition 3.2 has a minor practical drawback which can cause that in some very specific cases there is no simple C -detour \mathcal{S} -admissible $s-t$ walk even though a C -avoiding $s-t$ walk exists:

- Imagine a one-directional road segment $f' = (d, d')$ just preceding $f \in C$ (more generally, a local map area which can be left only through f). Then one cannot take a detour from d' , and a lower-scope detour edge from d may not be allowed by Def. 3.1.iii.
- Hence in such situation this f' is *effectively closed* as well, and we can capture this in a supplementary definition which consequently resolves the issue:

Definition 3.3 (Quasi-Closure). *Let (G, w) be a road network, $C \subseteq E(G)$ a set of closures and $t \in V(G)$ the target vertex. An edge $(u, v) \in E(G) \setminus C$ is C -quasi-closed for t if there is no \mathcal{S} -admissible $u-t$ walk starting with (u, v) in the subnetwork $(G - C, w)$.*

A C -quasi-closed edge for the start s is defined analogously in reverse.

For a set C of closures, we denote by C^* its *qc-closure*, i.e., the least fixed point of the operation of adding C -quasi-closed edges for t or s to C . We then easily amend the definition of simple detour admissibility as follows.

Definition 3.4 (Enhanced C -detour \mathcal{S} -admissibility). *Let (G, w) be a road network, \mathcal{S} a scope mapping on it, and $C \subseteq E(G)$ a set of road closures. An $s-t$ walk P is enhanced C -detour \mathcal{S} -admissible if P is simply C^* -detour \mathcal{S} -admissible, where C^* is the qc -closure of C .*

With that, and using also the definition of a *proper* scope mapping from [16], we can now state technical Proposition 3.5.

In a standard connectivity setting, a graph (road network) G is *routing-connected* if, for every pair of edges $e, f \in E(G)$, there exists a walk in G starting with e and ending with f . A scope mapping \mathcal{S} of a routing-connected graph G is *proper* if, for all $i \in Im(\mathcal{S})$, the subgraph $G^{[i]}$ induced by those edges $e \in E(G)$ such that $\mathcal{S}(e) \geq i$ is routing-connected.

Proposition 3.5. *Let (G, w) be a road network, \mathcal{S} a proper scope mapping on it, and $C \subseteq E(G)$ a set of road closures. Assume $s, t \in V(G)$. If there exists a C -avoiding s - t walk in (G, w) , i.e., one not containing any edge of C , then there also exists an enhanced C -detour \mathcal{S} -admissible s - t walk there.*

Enhanced C -Detour \mathcal{S} -Dijkstra's Algorithm. The only difference between this algorithm and the simple one is that we have to compute the qc-closure set of C . This must be done between step 1 and step 2 of the simple C -detour \mathcal{S} -Dijkstra's algorithm as follows:

1.1 Construction of qc-closure of C

In order to get qc-closure of C we have to run a set of bidirectional \mathcal{S} -Dijkstra algorithms from s to t with a minor modification – we are relaxing all \mathcal{S} -admissible edges (i.e., not only those improving distance estimates). In the next run, all edges from C are removed in G and the same algorithm is executed again. Edges which cannot be reached from t by \mathcal{S} -admissible walk (in reversed road network) are quasi-closures. They will be removed from the road network in the next run. This process continues until all qc-closure set C^* is found.

By a clever implementation, one can even identify qc-closure set in a single run of bidirectional \mathcal{S} -Dijkstra's algorithm. Due to lack of space we omit further details in this paper and claim that even the implementation of the naive process above requires only a small number of iterations in practice.

3.4 Full Detour Admissibility

In addition to the simple approach of Definition 3.2 (and its enhanced version), we briefly outline a deeper approach which better fits into the overall idea of scope and comfortable routes, but is technically complicated and not suited for introductory explanation. That is why give here an informal outline, while the bare formal definition is left for the appendix.

- In static \mathcal{S} -admissibility, we informally count the \mathcal{S} -draw value of the travelled subwalk, and use this information to decide admissibility of edges of restricted scope. The same is naturally extended to obstructed vertices and their detours: Each time a C -obstructed vertex d is reached, this lowers the current \mathcal{S} -draw value (a better variant of a detour permit) to one depending on how far d is from the actual closure (again measured in terms of \mathcal{S} -draw).

- This lowered \mathcal{S} -draw value then allows exceptional use of low-level edges for a limited extent since d (in the exactly same way as low-level edges are allowed near the start s). The same, of course, happens in reverse.
- A complication comes from a fact that the whole concept has to be considered recursively. This is because lowered \mathcal{S} -draw value affects C -obstructed vertices further on (there are more of them then, cf. also secondary detours) and adds more possibilities of “detours on detours”.

Altogether, the outlined ideas lead to a smooth, though complicated, definition which nicely incorporates into \mathcal{S} -Dijkstra’s algorithm. There is also a possibility of a simplified version considering detour permits only on primary closures—the advantage being in a simple implementation, virtually almost the same as in Section 3.2.

3.5 Experimental Work

We have implemented a very simple prototype in order to prove good practical performance of both simple and enhanced C -detour \mathcal{S} -Dijkstra’s algorithms. Algorithms were implemented in C and compiled using gcc-4.5.1 without any optimization flags running in a single thread on a machine with Intel Core i3 CPU 2.40 GHz with 4 GB RAM. We have used two road networks constructed from publicly available TIGER/Line 2010 US roads data. Both road network had 10 000 edges and were assigned a scope mapping simply according to (corrected) road categories and then it was artificially balanced to be proper. First road network contains a very small city and its rural area, the second contains a bigger urban area.

We did a set of 500 queries for pairs of randomly distant vertices and we placed a few (50) closures randomly on unbounded edges and edge nearby middle of the optimal \mathcal{S} -admissible walk between a pair so that at least one closure hits the walk. First, we were looking how many quasi-closures will be needed in enhanced detour algorithm. The number was very low² – in average there were only 19 quasi-closures and the maximum number of iterations needed to find a qc-closure set was 3. Interestingly, there was no significant difference between rural and urban testing instance. In average, detour algorithm increased the number of scanned vertices just by approx. 8% and we claim that this number can improved a lot by a better implementation. Of course, in case of enhanced algorithm there are more obstructed vertices given by quasi-closures, but the difference between running time of both algorithms is neglectable – 9.2ms and 11.2ms in average.

3.6 A Note on Detours in Multi-Staging Scope-Based Approach

The most important computational aspect of scope lies in the fact that only the edges of *unbounded* scope level ∞ matter for global preprocessing (an idea

² Originally, our testing instances contained a lot of degree 2 vertices which was causing a lot of “fake” quasi-closures, this problem was solved by merging long chains of such edges into a single edge.

related to better known *reach* [5]). Informally, the query algorithm of [16] works in stages: In the *opening cellular phase*, the road network is locally searched (unidirectional \mathcal{S} -Dijkstra) from both start and target vertices until only edges of unbounded scope are admissible. Then a small preprocessed “boundary graph” is searched by another algorithm (e.g. hub-based labeling [15]) in the *boundary phase*. Finally, in the *closing cellular phase*, the scope-unbounded long middle section of the route is “unrolled” in the whole network.

We remark that the boundary graph will remain static even in the dynamic scenario (due to expensive preprocessing), and dynamic changes are mainly dealt with in the closing cellular phase. We first remark on the “only negative change” assumption of our approach (Sec. 2). This well corresponds with a real-world situation in which just “bad things happen on the road”, and the driver thus usually has to find an available detour, instead of looking for unlikely road improvements. Therefore, we are content if our query algorithm finds that an optimal route of the original network (wrt. w) is admissible, though not perfectly optimal,³ in the changed network (with w^*). However, when things go worse with w^* , then our algorithm works efficiently.

4 Conclusion

We have outlined the current state of our work on dynamization of the scope-base route planning technique [16] for both unexpected and predictable (to some extend) negative road network changes (closures). Our approach is aimed at a proper relaxation of scope admissibility when a driver approaches changed road segment, by locally re-allowing nearby roads of lower scope level. At the same time we claim that the computed detour minimizes costs and still remains reasonable in terms of scope admissibility.

In a summary, we have shown that a scope-based route planning approach with cellular preprocessing [16] can be used not only in static but also in dynamic road networks and briefly demonstrated that proof of concept works well in practice. Our immediate future work in this direction will include the following points:

- an efficient implementation of full C -detour algorithm,
- incorporation of route restrictions and possibly other aspects, and
- more extensive experimental evaluation of the final implementation.

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³ Note that a designated detour of a road construction may perhaps turn out faster than another previously optimal route.

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A Classical Dijkstra's Algorithm

Classical Dijkstra's algorithm solves the single source shortest paths problem⁴ in a graph G with a non-negative weighting w . Let $s \in V(G)$ be the start vertex (and, optionally, let $t \in V(G)$ be the target vertex).

- The algorithm maintains, for all $v \in V(G)$, a (*temporary*) *distance estimate* of the shortest path from s to v found so far in $d[v]$, and a predecessor of v on that path in $\pi[v]$.
- The scanned vertices, i.e. those with $d[v] = \delta_w(s, v)$ confirmed, are stored in the set T ; and the discovered but not yet scanned vertices, i.e. those with $\infty > d[v] \geq \delta_w(s, v)$, are stored in the set Q .
- The algorithm work as follows: it iteratively picks a vertex $u \in Q$ with minimum value $d[u]$ and relaxes all the edges (u, v) leaving u . Then u is removed from Q and added to T . *Relaxing* an edge (u, v) means to check if a shortest path estimate from s to v may be improved via u ; if so, then $d[v]$ and $\pi[v]$ are updated. Finally, v is added into Q if it is not there already.
- The algorithm terminates when Q is empty (or if t is scanned).

Time complexity depends on the implementation of Q ; such as it is $\mathcal{O}(|E(G)| + |V(G)| \log |V(G)|)$ with the Fibonacci heap.

Dijkstra's algorithm can be used “bidirectionally” to solve SPSP problem. Informally, one (forward) algorithm is executed from the start vertex in the original graph and another (reverse) algorithm is executed from the target in the reversed graph. Forward and reverse algorithms can alternate in any way and algorithm terminates, for instance, when there is a vertex scanned in both directions.

Algorithm A.1 Unidirectional Dijkstra's Algorithm

Input: A road network (G, w) and a start vertex $s \in V(G)$.

Output: For every $v \in V(G)$, an optimal $s - v$ walk in G (or ∞).

```

1: for  $\forall v \in V(G)$  do  $d[v] \leftarrow \infty$ ;  $\pi[v] \leftarrow \perp$ ; done                                // Initialization
2:  $d[s] \leftarrow 0$ ;  $Q \leftarrow \{s\}$ ;  $T \leftarrow \emptyset$ 

3: while  $Q \neq \emptyset \vee t \notin T$  do                                                // Main loop
4:    $u \leftarrow \min_{d[]}(Q)$ ;  $Q \leftarrow Q \setminus \{u\}$ 
5:   for all  $(u, v) \in E(G)$  do                                                    // Relaxation of  $(u, v)$ 
6:     if  $d[v] \geq d[u] + w(u, v)$  then  $d[v] \leftarrow d[u] + w(u, v)$ ;  $\pi[v] \leftarrow u$  fi
7:   done
8:    $T \leftarrow T \cup \{u\}$                                                         // Vertex  $u$  is now scanned
9: done
10: CONSTRUCTWALK  $(G, d, \pi)$                                                     // Postprocessing – generating output.
```

⁴ Given a graph and a start vertex find the shortest paths from it to the other vertices.

B \mathcal{S} -Dijkstra's Algorithm

Full pseudocode of \mathcal{S} -Dijkstra's algorithm as presented in [16] follows. For better understanding a concept of \mathcal{S} -reach and its effect is removed from the Algorithm B.1.

Algorithm B.1 Unidirectional \mathcal{S} -Dijkstra's Algorithm

Input: A road network (G, w) , a scope \mathcal{S} and a start vertex $s \in V(G)$.

Output: For every $v \in V(G)$, an optimal s -admissible walk from s to v in G (or ∞).

RELAX(u, v, γ)

```

1: if  $d[u] + w(u, v) < d[v]$  then                                // Temporary distance estimate updated.
2:    $Q \leftarrow Q \cup \{v\}$ 
3:    $d[v] \leftarrow d[u] + w(u, v)$ ;  $\pi[v] \leftarrow u$ 
4: fi
5: if  $d[u] + w(u, v) \leq d[v]$  then                                // Scope admissibility vector updated.
6:   for all  $i \in Im(\mathcal{S})$  do
7:      $\sigma_i[v] \leftarrow \min\{\sigma_i[v], \sigma_i[u] + \gamma_i\}$ 
8:   done
9: fi
10: return
```

\mathcal{S} -DIJKSTRA(G, w, \mathcal{S}, s)

```

1: for all  $v \in V(G)$  do                                          // Initialization.
2:    $d[v] \leftarrow \infty$ ;  $\pi[v] \leftarrow \perp$ ;                    // Distance estimate and predecessor.
3:    $\sigma[v] \leftarrow (\infty, \dots, \infty)$                     // Scope admissibility vector.
4: done
5:  $d[s] \leftarrow 0$ ;  $Q \leftarrow \{s\}$ ;  $\sigma[s] \leftarrow (0, \dots, 0)$ 
6: while  $Q \neq \emptyset$  do                                         // Main loop processing all vertices.
7:    $u \leftarrow \min_{d[]}(Q)$ ;  $Q \leftarrow Q \setminus \{u\}$            // Pick a vertex  $u$  with the minimum  $d[u]$ .
8:   for all  $f = (u, v) \in E(G)$  do                                // All edges from  $u$ ; subject to
9:     if  $\sigma_{\mathcal{S}(f)}[u] \leq \nu_{\mathcal{S}(f)}^{\mathcal{S}}$  then                        //  $s$ -admissibility check.
10:      for all  $i \in Im(\mathcal{S})$  do                                     // Adjustment to scope admissibility.
11:        if  $\mathcal{S}(f) > i$  then  $\gamma_i \leftarrow w(f)$  else  $\gamma_i \leftarrow 0$  fi
12:      done
13:      RELAX( $u, v, \gamma$ )                                         // Relaxation of  $f = (u, v)$ .
14:    fi
15:  done
16: done
17: CONSTRUCTWALK( $G, d, \pi$ )                                       // Postprocessing – generating output.
```

Bidirectional version of \mathcal{S} -Dijkstra's algorithm is analogous to the bidirectional version of classical algorithm – two searches are executed, one from the start and another from the target in the reverse road network. The algorithm terminates when there is a vertex scanned in both directions.

C Enhanced C -Detour \mathcal{S} -admissibility

In a standard connectivity setting, a graph (road network) G is *routing-connected* if, for every pair of edges $e, f \in E(G)$, there exists a walk in G starting with e and ending with f . This obviously important property can naturally be extended to our scope concept as follows.

Definition C.1 (Proper Scope). *A scope mapping \mathcal{S} of a routing-connected graph G is proper if, for all $i \in \text{Im}(\mathcal{S})$, the subgraph $G^{[i]}$ induced by those edges $e \in E(G)$ such that $\mathcal{S}(e) \geq i$ is routing-connected, too.*

Theorem C.2 ([16]). *Let (G, w) be a routing-connected road network and let \mathcal{S} be a proper scope mapping of it. Then, for every two edges $e = (s, x), f = (y, t) \in E(G)$, there exists an \mathcal{S} -admissible s - t walk $P \subseteq G$ such that P starts with the edge e and ends with f (i.e., an e - f walk).*

Proof (of Proposition 3.5). Let C^* denote the qc-closure of C (cf. Def. 3.4). By definition, an s - t walk is C -avoiding iff it is C^* -avoiding. By Theorem C.2, there is an \mathcal{S} -admissible s - t walk $P \subseteq G$, and we take an optimal such P .

Let $f = (u, v) \in E(P)$ be the first edge of P such that $f \in C^*$ (if such one does not exist, then we are done with P). Observe that there is another edge $f' = (u, v') \notin C^*$ from which t can be reached on a C^* -avoiding walk: If $u = s$, then this follows from the assumption of existence of a C -avoiding s - t walk. Otherwise, let $f_1 = (u_1, u)$ be the edge preceding f on P . Since $f_1 \notin C^*$ by our choice of f , there must be a C^* -avoiding u_1 - t walk starting with f_1 , and f' can be chosen as the second edge on it. Symmetric claim holds, of course, in reverse from t .

Now, the vertex u is C^* -obstructed for initial $\text{draw}^{\mathcal{S}}(P^{su})$ and target t , with obstruction level 0 (cf. Def. 3.1). Hence f' will be in accordance with point (iii.) of Def. 3.2. We take a new s - t walk P' with prefix $P^{su}.f'$ —this walk continues from f' to t with an optimal \mathcal{S} -admissible u - t walk that additionally never decreases the scope level at the start (such a walk exists thanks to proper scope mapping, analogically to the proof of Theorem C.2). If, again, P' intersects C^* , then we repeat the above argument. In a finite number of steps, we reach the conclusion. Obviously, the constructed walk may be far away from optimality, but that is not the objective of this claim. \square

D Full Detour Admissibility: the Definition

Definition D.1 (Full C -detour \mathcal{S} -admissibility). *Let (G, w) be a road network, \mathcal{S} a scope mapping on it, and $C \subseteq E(G)$ a set of road closures. An s - t walk $P = (s = u_0, e_1, \dots, e_k, u_k = t) \subseteq G$ is fully C -detour \mathcal{S} -admissible if $E(P) \cap C = \emptyset$ and the following are true:*

- i. There exist indices $a_0 = 0 < a_1 < \dots < a_p < k$, and $c_0 = k > c_1 > \dots > c_q > 0$ in reverse; here to avoid nested indexing, we shortly write $d_i = u_{a_i}$ and $d'_i = u_{c_i}$. Moreover, there is a set⁵ $B \subseteq V(P)$ such that, between every two succeeding d_i and d'_j on P , there is one selected vertex between them in B .*

⁵ The meaning of B is technical: This set presents the “breakpoints” on P at which we switch from considering \mathcal{S} -admissibility straight to considering it in reverse (i.e., from valuing \mathcal{S} -draw from the last obstructed vertex to borrowing it till the next obstructed vertex in reverse). Switch back happens automatically after finishing the detour.

- ii. $\pi[d_0] = \mathbf{0}$ is the zero \mathcal{S} -vector.
- iii. For each $i > 0$, this d_i is C -obstructed for the target t , and $\pi[d_i]$ shortly denotes the corresponding C -obstruction state of d_i . Specially, if $P^{d_{i-1}d_i}$ (the short subwalk from d_{i-1} to d_i) avoids B , then d_i is C -obstructed for the initial \mathcal{S} -vector $\omega[d_i]$ and t (otherwise, $\omega[d_i] = \infty$): $\omega[d_i] = \pi[d_{i-1}] + \text{draw}^{\mathcal{S}}(Q)$ where Q is an optimal $(d_{i-1}, \pi[d_{i-1}])$ -admissible d_{i-1} - d_i walk.
- iv. (ii.) and (iii.) are analogously formulated for d'_i in reverse.
- v. For each $e_{m+1} = (u_m, u_{m+1}) \in E(P)$, (at least) one of the following holds:
 - $\mathcal{S}(e_{m+1}) = \infty$.
 - $\mathcal{S}(e_{m+1}) = \ell < \infty$, and there exists $0 \leq j \leq m$ such that $j = a_i$, the subwalk $P^{d_i u_m}$ from d_i to (including) u_m is disjoint from $B \cup \{d'_1, \dots, d'_q\}$, and the following is fulfilled: It is $\pi_\ell[d_i] + [\text{draw}^{\mathcal{S}}(Q)]_\ell \leq \nu_\ell^{\mathcal{S}}$ for some optimal $(d_i, \pi[d_i])$ -admissible d_i - u_m walk Q .
 - The previous holds in reverse for some $m+1 \leq j \leq k$ such that $j = c_i$.